Fat Tails and the Social Cost of Carbon

By Martin L. Weitzman*

At high enough greenhouse gas (GHG) con-I. A Super-Simple Expository Model centrations, climate change might conceivably cause catastrophic damages with small but The simplistic model here has two periods. nonnegligible probabilities. Other things bein some base case of abatement strategy is given. equal, this should lower the discount rate usedAll consumption refers to "effective consumpto evaluate mitigation-investment decisions antidon"—after climate change damages have raise the social cost of carbon (SCC). If the badbeen subtracted. The utility of consumption is tail of climate damages is sufficiently fat with U(C). Present consumption \mathfrak{S}_0 . Future conprobability, and if the utility function has relasumption is the random variable whose tive risk aversion greater than one, then (at leastlected utility is discounted by β. Welfare is in theory for at least some formulations) thin $U(C_0) + \beta E[U(\tilde{C})]$, where E is the expecinsurance-like catastrophe-reducing aspect ofation operator. Letrepresent a catastrophic mitigation investments can be very powerful. In walue of effective consumption that occurs the most extreme limit this tail-hedge insuranceith probability, where both and p are coneffect can be infinitely strong and can domi-sidered to be "very small." nate the economic analysis by making the SCC Suppose that one extra unit of carbon abateinfinite. This kind of extreme (and empirically ment uniformly shifts upwards future consumpunbelievable) limiting result is a version of whattion by the multiplicative factor $\theta > T$ is is I have previously labeled the "dismal theorem." consistent with having a multiplicative damages

In this paper I use the simplest possible model function.) For utmost simplicity, I now analyze to lay bare the basic structure of the argumen torlly the effect upon the catastrophe outcome, then attempt to place the underlying issues in wahich is the main focus of attention for this balanced perspective. The "dismal theorem" of paper. The effect is that with probabilityhe an infiniteSCC is a theoretical limiting resultpostabatement level of catastrophic consumption which relies on particular assumptions that maps now $(1 + \theta)\underline{C}$, instead of the preabatement or may not have actual relevance for climateevel of \underline{C} . Abatement here induces first-order change policy depending upon the interaction of tochastic dominance via an upward shift in the a variety of empirical factors, functional forms probability-p point mas $\mathfrak{C} \to (1 + \theta)C$. and parameter values. I argue that the main value The social cost of carbon (SCC) is the (nega of the "dismal theorem" is to serve as a warning ive of the) change in per small change in flagthat a credible economic analysis of climate abatement that would give the same level of change should seriously consider extreme tailwelfareW as before. In words, it is the willingvalues of damages and their associated prob-ness to pay for a small extra unit of abatement. abilities because they may have the potential tassume utility is of the CRRA form U(C = $C^{1-\eta}/(1-\eta)$, where the coefficient of relaincrease the SCC significantly.

tive risk aversion is $\eta > 1$. Normali $\mathcal{D}_{\theta} = 1$. With this specification, the SCC here is readily calculated to be

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[†] Go to http://dx.doi.org/10.1257/aer.104.5.544 to visit
the article page for additional materials and author disclo- ²A procedure for empirically deriving the SCC is
sure statement(s).
described, e.g., in Greenstone, Kopits, and Wolverton

1 See Weitzma (2009, 2011). (2013).

On Not Revisiting Official Discount Rates: Institutional Inertia and the Social Cost of Carbon[†]

By Cass R. Sunstein*

Within the executive branch, important decicalls for discount rates of 7 percent "whenever sions result from both substantive judgments the main effect of a regulation is to displace or and institutional constraints. The constraints the use of capital in the private sector" and 3 take the form of three sets of costs: decision percent "when regulation primarily and directly costs, opportunity costs, and political costs. Inaffects private consumption (e.g., through higher exploring the workings of government, econo- consumer prices for goods and services) (OMB mists and economically oriented law professors 2003). Emphasizing both ethical considerations have placed far too much emphasis on the role and the role of uncertainty with respect to inter of interest groups and far too little emphasis orest rates over time(Weitzman 1998), Circular a far larger set of institutional constraints, off-4 also allows "a further sensitivity analysis which interest-group activity is at most one partusing a lower but positive discount rate" when a Because of those constraints, it can be costlyule "will have important intergenerational benand difficult to change existing policies, espe-efits or costs" (OMB 2003). cially when such changes typically require a With respect to climate change in particular, consensus among diverse people, who may have the relevant guidance, coming in the form of a

strong views and who have many demands on Technical Support Document (TSD), was issued their time. For public officials,a degree of insti- by the Interagency Working Group on Social tutional inertia is often a product of a consideredost of Carbon in 2010 (Interagency Working analysis of the full set of costs and benefits Both Group 2010; Greenstone, Kopits, and Wolverton decision costs and error costs must be taken int 2011). The Interagency Working Group, which I helped to convene, included representatives of

With respect to discount rates in the domainthe Council of Economic Advisers, the Council of regulation, the central governing documenton Environmental Quality, the Department of is Office of Management and Budget (OMB) Agriculture, the Department of Commerce, Circular A-4, issued in 2003 (OMB 2003). the Department of Energy, the Department of Circular A-4 was produced by officials within Transportation, the Environmental Protection the executive branch, coming from diverse parts Agency, the National Economic Council, the of the federal government; both political appoin-Office of Energy and Climate Change, the tees and career officials played a role. The Officeof Management and Budget, the Office Council of Economic Advisers and the Office of Science and Technology Policy, and the of Information and Regulatory Affairs (OIRA) Department of the Treasury. The resulting docuwere particularly important. An initial versionment describes the monetary value of reductions was presented to the public for comments andin carbon emissions, in a way that bears on a also subjected to peer review. OMB Circular A-4 large number of regulatory judgments. In that sense, the United States has in fact "put a price on carbon."

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Importantly, the TSD adopts a global, rather School, Harvard University, 1563 Massachusetts Avenue, than merely domestic, measure of damages; harms to people in China, Europe, Africa, and The author is grateful to Michael Greenstone, Eric Posner, India are counted. The TSD notes that climate and Lucia Reisch for valuable comments on an earlier draft. change involves "a global externality," that it the article page for additional materials and author disclo-"presents a problem that the United States alone cannot solve," and that "the United States has

sure statement(s).

convective precipitation likely to increase more rapidly than stratiform precipitation⁶⁹. However, other changes — such as shifts in large-scale circulation patterns — may have different responses to climate change in different seasons¹⁰, and this can also influence trends in extreme precipitation intensity. as observed here. Simulating the combined effect of all of these processes remains a major challenge in climate modelling. Although some recent modelling studies have emphasized sub-daily precipitation¹, more work is needed to understand the dominant processes that govern changes in extreme precipitation at both short (sub-daily and subhourly) and long timescales.

Given the fundamental relationship between catchment size, the duration of an extreme precipitation event and flood magnitude¹², the finding that extreme precipitation is changing at different timescales has potentially surprising implications for flood risk. Our results show that different or even opposing trends in flood risk are possible within a single geographic region, such as neighbouring catchments of different sizes, or even smaller sub-catchments within the same larger basin. This will be of interest to those involved in land-use planning, water infrastructure design (for example dams, leves, bridges and storm-water drainage networks), floodplain management, emergency response, as well as to the insurance industry.

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Additional information

Supplementary information is available in the online version of the paper

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CORRESPONDENCE:

IAMs and peer review

To the Editor — Integrated assessment models (IAMs) have provided the bulk of the evidence relied on by prominent documents—such as the Stern Report and the contributions of Working Group III to the IPCC Assessment Reports^{2,3} — as well as numerous research articles on the economics of climate change mitigation and related issues. I am concerned, however, that many published IAM-based research articles fail to adequately explain the basis for their findings, and do not justify these findings carefully based on sound scientific and logical argumentation, analysis, and data presented in the article itself (or in published appendices). Often the details of how the IAMs were used to derive the basic results are not described, meaning that reviewers cannot credibly assess the reliability of the results.

One major flaw of most, if not all, peer reviews of IAM-based research reports is that the models relied upon have not been reviewed in themselves. And yet such articles cannot be adequately reviewed without carefully critiquing the underlying models. All too often the original models, and subsequent versions, have never been formally peer reviewed publicly. Due to these shortcomings, even the recent 'model intercomparison projects" are, I would argue, of limited value.

Because economics claims to be a science. and because economists have developed many different IAMs, peer reviewers of IAMbased research articles should, in my view, assess: (1) the theory behind each model in light of model's intended purpose; (2) the structure of the model to determine if the theory was properly implemented; (3) the way in which various structural parameters were estimated based on historical data; and (4) the way in which the values of various input parameters were estimated or derived, especially those for the future. The last point is a particular problem because many IAMbased studies involve very long-term, multidecadal projections. In addition, I believe that peer reviewers must especially assess how the model is being used in relation to the particular research questions being addressed, and what sensitivity analyses have been performed that might illuminate the answers to these questions. If any of these steps are skipped, then confidence in the reported findings is reduced. Of course, if some of these steps have been undertaken for previously published articles using the same IAM, and if the model has not significantly changed since these reviews were completed, then some of the above steps could be deemed to be complete prior to the current

review. It would be helpful in this regard if past reviews of the particular IAM were made available in some format. But this is almost never done.

In 2013, the IAM Consortium — which was set up at the request of the IPCC after the Fourth Assessment Report and of which I am a member — set up scientific working groups intending to establish community-wide standards on IAM documentation and the inclusion of key input assumptions in research publications. There has been little or no progress since. It is my contention that this situation should be rectified, so as to usher in a new era for peer reviews in this field.

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CORRESPONDENCE:

Long history of IAM comparisons

To the Editor— We agree with the point made in a recent Editorial in this journal¹ that the assumptions behind models of all types, including integrated assessment models (IAMs), should be as transparent as possible. However, it is incorrect to imply that the IAM community is just "now emulating the efforts of climate researchers by instigating their own model intercomparison projects."

In fact, model comparisons for integrated assessment and climate models followed a remarkably similar trajectory. Early general circulation model (GCM) comparison efforts? evolved to the first Atmospheric Model Inter-comparison Project (AMIP), which was initiated in the early 1990s?. Atmospheric models developed into coupled atmosphere—ocean models (AOGCMs) and results from the first Coupled Model Inter-Comparison Project (CMIP1) became available about a decade later4.

Results of first energy model comparison exercise, conducted under the auspices of the Stanford Energy Modeling Forum, were published in 1977. A summary of the first comparison focused on climate change was published in 1993. As energy

models were coupled to simple economic and climate models to form IAMs, the first comparison exercise for IAMs (EMF 14; https://emf.stanford.edu/projects) was initiated in 1994, and IAM comparison exercises have been ongoing since this time^{7–10} — and were recently assessed in the latest IPCC report¹¹ — including a publicly accessible database of scenarios (https://secure.iiasa.ac.at/web-apps/ene/AR5DB).

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CORRESPONDENCE:

Strategies for changing the intellectual climate

To the Editor— Castree et al.¹ are correct that a 'single, seamless concept of integrated knowledge' cannot do justice to the diversity of meanings that need to be brought to bear in addressing the challenges of global environmental change. We also agree with them that environmental social sciences and humanities (ESSH) can make important contributions to global environmental change (GEC) science. However, their charge that we ignore the full range of anthropological contributions to understanding of climate change reflects a misreading of our recent Perspective' in this journal, as we only attempted to

discuss a few exemplary strands of the many contributions from anthropology to a richer understanding of climate change (for a more detailed discussion, see our forthcoming edited volume³).

Secondly, Castree et al. suggest that we are reinforcing the status quo in GEC science and 'pulling our punches' by using terms common in Earth systems science (such as system and mechanism). Our use of such terms reflected a strategy to use familiar language to raise awareness of anthropological contributions little known to most GEC scientists, along the lines of the 'clumsy solutions' proposed by

anthropologist Steven Rayner⁴. Rayner calls for these solutions to 'wicked problems' such as climate change — problems marked by deep underlying conflictsabout the nature of the problem itself — because they can allow different actors to work together without sharing ethical or epistemological principles. We agree with Castreeet al. that other strategies are possible, but not that theirs is the only route to a wider dialogue.

Castree et al. focus on three texts to illustrate how GEC scientists evoke the notion of seamless, totalizing knowledge. They single out the use of terms such as 'integration' in discussions of knowledge to

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The social cost of atmospheric release

Drew T. Shindell

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Abstract I present a multi-impact economic valuation framework called the Social Cost of Atmospheric Release (SCAR) that extends the Social Cost of Carbon (SCC) used previously for carbon dioxide (CO₂) to a broader range of pollutants and impacts. Values consistently incorporate health impacts of air quality along with climate damages. The latter include damages associated with aerosol-induced hydrologic cycle changes that lead to net climate benefits when reducing cooling aerosols. Evaluating a 1 % reduction in current global emissions, benefits with a high discount rate are greatest for reductions of co-emitted products of incomplete combustion (PIC), followed by sulfur dioxide (SO₂), nitrogen oxides (NO_x) and then CO₂, ammonia and methane. With a low discount rate, benefits are greatest for PIC, with CO₂ and SO₂ next, followed by NO_x and methane. These results suggest that efforts to mitigate atmosphere-related environmental damages should target a broad set of emissions including CO₂, methane and aerosol/ozone precursors. Illustrative calculations indicate environmental damages are \$330-970 billion yr⁻¹ for current US electricity generation (~14–34¢ per kWh for coal, ~4-18¢ for gas) and \$3.80 (-1.80/+2.10) per gallon of gasoline (\$4.80 (-3.10/+3.50) per gallon for diesel). These results suggest that total atmosphere-related environmental damages plus generation costs are much greater for coal-fired power than other types of electricity generation, and that damages associated with gasoline vehicles substantially exceed those for electric vehicles.

1 Introduction

Societal assessment of environmental threats depends upon a variety of factors including physical science-based estimates of the risk of impacts and economic valuation of those impacts. Quantitative estimates of costs and benefits associated with particular policy options can inform responses, but such valuations face a myriad of issues, including the choice of which impacts to 'internalize' within the economic valuation, the value of future versus present risk, and how to compare different types of impacts on a common scale (e.g. (Arrow et al. 2013; European Commission 1995; Johnson and Hope 2012; Muller et al. 2011; National Research Council 2010, hereafter NRC2010; Nordhaus and Boyer 2000)).

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Fran Sussman*, Christopher P. Weaver and Anne Grambsch

Challenges in applying the paradigm of welfare economics to climate change

Abstract: This paper discusses the challenges inherent in developing benefitcost analysis (BCAs) of climate change. Challenges are explored from three perspectives: meeting the foundational premises for conducting BCA within the framework of welfare economics, methodological considerations that affect the application of the tools and techniques of BCA, and practical limitations that arise out of resource constraints and the nature of the question, project, or policy being evaluated. Although economic analysts frequently face - and overcome - conceptual and practical complications in developing BCAs, climate change presents difficulties beyond those posed by more conventional environmental problems. Five characteristics of the climate system and associated impacts on human and natural systems are identified that pose particular challenges to BCA of climate change, including ubiquity of impacts, intangibility, non-marginal changes, long timeframes, and uncertainty. These characteristics interact with traditional economic challenges, such as valuing non-market impact, addressing non-marginal changes, accounting for low-probability but high-impact events, and the eternal issue of appropriately discounting the future. A mapping between the characteristics of climate change and traditional economic challenges highlights the difficulties analysts are likely to encounter in conducting BCA. Despite these challenges, the paper argues that the fundamental ability of economic analysis to evaluate alternatives and tradeoffs is vital to decision making. Climate-related decisions span a wide range in terms of their scope, complexity, and depth, and for many applications of economic analyses the issues associated with climate change are tractable. In other cases it may require improved economic techniques or taking steps to ensure uncertainty is more fully addressed. Augmenting economic analysis with distribution analysis or an account of physical effects, and exploring how economic benefit and cost estimates can be incorporated into broader decision making frameworks have also been suggested. The paper concludes that there are opportunities for BCA to play a key role in informing climate change decision-making.

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Integrated assessment of climate change: state of the literature

Abstract: This paper reviews applications of benefit-cost analysis (BCA) in climate policy assessment at the US national and global scales. Two different but related major application types are addressed. First there are global-scale analyses that focus on calculating optimal global carbon emissions trajectories and carbon prices that maximize global welfare. The second application is the use of the same tools to compute the social cost of carbon (SCC) for use in US regulatory processes. The SCC is defined as the climate damages attributable to an increase of one metric ton of carbon dioxide emissions above a baseline emissions trajectory that assumes no new climate policies. The paper describes the three main quantitative models that have been used in the optimal carbon policy and SCC calculations and then summarizes the range of results that have been produced using them. The results span an extremely broad range (up to an order of magnitude) across modeling platforms as well as across the plausible ranges of input assumptions to a single model. This broad range of results sets the stage for a discussion of the five key challenges that face BCA practitioners participating in the national and global climate change policy analysis arenas: (1) including the possibility of catastrophic outcomes; (2) factoring in equity and income distribution considerations; (3) addressing intertemporal discounting and intergenerational equity; (4) projecting baseline demographics, technological change, and policies inside and outside the energy sector; and (5) characterizing the full set of uncertainties to be dealt with and designing a decision-making process that updates and adapts new scientific and economic information into that process in a timely and productive manner. The paper closes by describing how the BCA models have been useful in climate policy discussions to date despite the uncertainties that pervade the results that have been produced.

Keywords: benefit-cost analysis; climate change; integrated assessment; optimal carbon emissions; social cost of carbon.

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Leakage, Welfare, and Cost-Effectiveness of Carbon Policy

By Kathy Baylis, Don Fullerton, and Daniel H. Karney*

Policymakers fear that a unilateral carefulects can also arise with positive leakage. policy will reduce competitiveness, increaseonversely, positive leakage does not always imports, and lead to higher carbon emissionsean positive welfare cost. elsewhere("leakage"). In Fullerton, Karney, Actual carbon policy is not likely to be applied and Baylis (2012), we show that it may actuaniformly across all countries and sectors. The ally reduce emissions in other sectors ("negatible Emission Trading Scheme EU-ETS) covleakage"). But reducing emissions in both secers only about 40 percent of emissionstip(://tors may merely reflectwelfare costs of carbon palout 40 percent of emission that) policy that reduce real income and, thus, reduce the United States, the Waxman-Markey bill consumption of both outputs. These possibilities oposed carbon policy primarily in the electric-capture the concern that unilateral carbon polyics ector. Metcalf and Weisba 2009() estimight have a high cost per global unit of carbonate that even a very broad carbon policy can abated (that is, low "cost effectiveness"). include only 80 to 90 percent of emissions, so

Based on Harberger 1962), the two-input, applied carbon policy will likely leave some sectwo-output analytical general equilibrium mbodes uncovered. Raising one sector's carbon tax of Fullerton, Karney, and Ba 201s2) (could may have welfare costs if the other sector has no represent two countries or two sectors of a clossection tax, but, on the other hand, that other sececonomy. Each sector has some initial carbon tax may face an indirect price of carbon through or price, and the paper solves for the effect othanes on fossil fuels such as gasoline. Those fuels small increase in one sector's carbon tax on they serve as substitutes for electricity, so a new quantity of emissions in each sector. But it does bon tax in the electricity sector may shift connot solve for welfare effects. Here, we use stamption back somewhat from the low-taxed same model but derive expressions for the coselectricity sector into other fuels. In that case, a effectiveness of a unilateral carbon tax—the weak-carbon tax just in the electricity sector may fare cost per ton of emission reduction. We shaw crease welfare despite positive leakage. that higher leakage does not always mean lowein is paper makes several contributions. First, welfare. If one sector is already taxed at a high medemonstrate the generality of the Fullerton, rate, then an increase in the other sector's Ktankney, and Bay I 120(12) model by showing might reduce deadweight loss fprone existing cases where leakage can exceed procent. We misal locations. Thus, abatement can have negative for conditions under which total emissions tive cost. The welfare cost most directly dependencese or decrease. We also solve for welfare on the relative levels of tax in the two sectorse Mesets, and for "cost effectivenessis" (addishow that negative leakage always correspontions alwelfare cost per ton of net abathermocht) to a negative income effect, but negative incomme explore the relationship between the sign of leakage and the sign of the effect on welfare.

*Baylis: Department of Agricultural and Consumeradweight loss into two components. First, the Economics, University of Illinois (e-mail: baylis@illimilateral increase in carbon tax worsens a pronois.edu); Fullerton: Department of Finance, University of Illinois and NBER (e-mail: dfullert@illinois.edg/uction distortion, as that sector substitutes from Karney: Department of Economics, University of Illinoiarbon to other inputs (such as labor or capital (e-mail: dkarney2@illinois.edu). We are grateful for sfor abatement). Second, it affects a consumption gestions from Jared Carbone, Brian Copeland, Sam Kortudistortion, the existing misal location between Sebastian Rausch, lan Sue Wing, and Niven Winchester.

† To view additional materials, and author disclosure

preexisting carbon tax rate and carbon intensity,

this consumption distortion may rise or fall.

to view additional materials, and author disclosure statement(s), visit the article page at http://dx.doi.org/10.1257/aer.103.3.332.

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The Costs and Consequences of Clean Air Act Regulation of CO₂ from Power Plants[†]

By Dallas Burtraw, Josh Linn, Karen Palmer, and Anthony Paul*

The Clean Air AqCAA) provides the regallow the use of regulatory flexibility—perhaps ulatory framework for climate policy in introducing market-based approaches. United States. In 2011, the US Environmental This paper surveys the major policy approaches Protection AgencyPA) enacted regulations EPA and the states are likely to consider if mar for light-duty vehicles that require a 5 pleants are to be harnessed to achieve a cost-effeccent improvement in fuel economy per yearive outcome. Each approach differs in the way it and implemented preconstruction permitting ates and allocates asset values, and this differ for greenhouse gas emissions. The next majorence has important distributional and efficiency category to be regulated is stationary sources, sequences. Using a simulation model of the beginning with electricity generators, which be electricity system, we compare policies that responsible for nearly 40 percent of the nation of the nation of the patient of the patient of the nation of the patient of the nation of the n

Most observers perceive the failure tionovations make this modeling valuable: the adopt comprehensive legislatione., (the model includes the firsteconometric estimates of Waxman-Markey bill, HR 2454) the 111th the costs of improving emissions rates at existing Congress as a major undoing for US climateoal boilers, and investments in energy efficiency policy. However, the United States remains posite paid for with emissions allowance auction tioned to achieve domestic emissions reductions endogenously affecting electricity in 2020 as great as would have been achievedrices, investment, and system operation, and under that legislation (raw and Woerman yielding dynamic demand reductions.

2013). This could enable the United States to The policies we consider create valuable achieve President Obama's pledge of a 17 perassets, and they direct those asset values to four cent reduction from 2005 emissions levels by Iternative groups or uses: government, owners 2020 for CQ. Achieving the pledge hinges on theof fossil-firedgenerators, electricity consumers, stringency and nature of regulations for the pawdend-use energy efficiency.

Sector. We compare a cap-and-trade policy that The form of the regulations will determine the sauction revenue to government, and may their cost effectiveness. In 2013, President fact be implemented by states rather than Obama directed EPA to move forward with regine federal government, with a tradable per ulations that, "to the greatest extent possible mance standard that distributes the value to fossil-fuel-firedelectricity generators. The stan-

^{*} Burtraw: Resources for the Future, 1616 P Street NW, Washington, DC 20036 (e-maiburtraw@rff.org); Linn: generators that outperform the standard to sell Resources for the Future, 1616 P Street NW, Washington, edits to those that do not meet it. We com-DC 20036 (e-mail:linn@rff.org); Palmer: Resources for the pare these with two other options, following Future, 1616 P Street NW, Washington, DC 20036 (e-mail) the two existing state-level cap-and-trade propalmer@rff.org); Paul: Resources for the Future, 1616 P Street NW, Washington, DC 20036 (e-mail) the two existing state-level cap-and-trade propalmer@rff.org); Paul: Resources for the Future, 1616 P Street NW, Washington, DC 20036 (e-mail) the two existing state-level cap-and-trade propalmer@rff.org); Paul: Resources for the Future, 1616 P Street NW, Washington, DC 20036 (e-mail) the two existing state-level cap-and-trade propalmer@rff.org); Paul: Resources for the Future, 1616 P Street NW, Washington, DC 20036 (e-mail) the two existing state-level cap-and-trade propalmer@rff.org); Paul: Resources for the Future, 1616 P Street NW, Washington, DC 20036 (e-mail) the two existing state-level cap-and-trade propalmer@rff.org); Paul: Resources for the Future, 1616 P Street NW, Washington, DC 20036 (e-mail) the two existing state-level cap-and-trade propalmer@rff.org); Paul: Resources for the Future, 1616 P Street NW, Washington, DC 20036 (e-mail) the two existing state-level cap-and-trade propalmer@rff.org); Paul: Resources for the Future, 1616 P Street NW, Washington, DC 20036 (e-mail) the two existing state-level cap-and-trade propalmer@rff.org); Paul: Resources for the Future, 1616 P Street NW, Washington, DC 20036 (e-mail) the two existing state-level cap-and-trade propalmer@rff.org); Paul: Resources for the Future, 1616 P Street NW, Washington, DC 20036 (e-mail) the two existing state-level cap-and-trade propalmer@rff.org); Paul: Resources for the Future, 1616 P Street NW, Washington, DC 20036 (e-mail) the two existing state-level cap-and-trade propalmer@rff.org)

[†] Go to http://dx.doi.org/10.1257/aer.104.5.557 to visit 1 http://www.whitehouse.gov/the-press-office/2013/06/the article page for additional materials and author dss/poresidential-memorandum-power-sector-carbon-surestatement(s).

convective precipitation likely to increase more rapidly than stratiform precipitation⁶⁹. However, other changes — such as shifts in large-scale circulation patterns — may have different responses to climate change in different seasons¹⁰, and this can also influence trends in extreme precipitation intensity. as observed here. Simulating the combined effect of all of these processes remains a major challenge in climate modelling. Although some recent modelling studies have emphasized sub-daily precipitation¹, more work is needed to understand the dominant processes that govern changes in extreme precipitation at both short (sub-daily and subhourly) and long timescales.

Given the fundamental relationship between catchment size, the duration of an extreme precipitation event and flood magnitude¹², the finding that extreme precipitation is changing at different timescales has potentially surprising implications for flood risk. Our results show that different or even opposing trends in flood risk are possible within a single geographic region, such as neighbouring catchments of different sizes, or even smaller sub-catchments within the same larger basin. This will be of interest to those involved in land-use planning, water infrastructure design (for example dams, leves, bridges and storm-water drainage networks), floodplain management, emergency response, as well as to the insurance industry.

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Additional information

Supplementary information is available in the online version of the paper

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CORRESPONDENCE:

IAMs and peer review

To the Editor — Integrated assessment models (IAMs) have provided the bulk of the evidence relied on by prominent documents—such as the Stern Report and the contributions of Working Group III to the IPCC Assessment Reports^{2,3} — as well as numerous research articles on the economics of climate change mitigation and related issues. I am concerned, however, that many published IAM-based research articles fail to adequately explain the basis for their findings, and do not justify these findings carefully based on sound scientific and logical argumentation, analysis, and data presented in the article itself (or in published appendices). Often the details of how the IAMs were used to derive the basic results are not described, meaning that reviewers cannot credibly assess the reliability of the results.

One major flaw of most, if not all, peer reviews of IAM-based research reports is that the models relied upon have not been reviewed in themselves. And yet such articles cannot be adequately reviewed without carefully critiquing the underlying models. All too often the original models, and subsequent versions, have never been formally peer reviewed publicly. Due to these shortcomings, even the recent 'model intercomparison projects" are, I would argue, of limited value.

Because economics claims to be a science. and because economists have developed many different IAMs, peer reviewers of IAMbased research articles should, in my view, assess: (1) the theory behind each model in light of model's intended purpose; (2) the structure of the model to determine if the theory was properly implemented; (3) the way in which various structural parameters were estimated based on historical data; and (4) the way in which the values of various input parameters were estimated or derived, especially those for the future. The last point is a particular problem because many IAMbased studies involve very long-term, multidecadal projections. In addition, I believe that peer reviewers must especially assess how the model is being used in relation to the particular research questions being addressed, and what sensitivity analyses have been performed that might illuminate the answers to these questions. If any of these steps are skipped, then confidence in the reported findings is reduced. Of course, if some of these steps have been undertaken for previously published articles using the same IAM, and if the model has not significantly changed since these reviews were completed, then some of the above steps could be deemed to be complete prior to the current

review. It would be helpful in this regard if past reviews of the particular IAM were made available in some format. But this is almost never done.

In 2013, the IAM Consortium — which was set up at the request of the IPCC after the Fourth Assessment Report and of which I am a member — set up scientific working groups intending to establish community-wide standards on IAM documentation and the inclusion of key input assumptions in research publications. There has been little or no progress since. It is my contention that this situation should be rectified, so as to usher in a new era for peer reviews in this field.

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CORRESPONDENCE:

Long history of IAM comparisons

To the Editor— We agree with the point made in a recent Editorial in this journal¹ that the assumptions behind models of all types, including integrated assessment models (IAMs), should be as transparent as possible. However, it is incorrect to imply that the IAM community is just "now emulating the efforts of climate researchers by instigating their own model intercomparison projects."

In fact, model comparisons for integrated assessment and climate models followed a remarkably similar trajectory. Early general circulation model (GCM) comparison efforts? evolved to the first Atmospheric Model Inter-comparison Project (AMIP), which was initiated in the early 1990s?. Atmospheric models developed into coupled atmosphere—ocean models (AOGCMs) and results from the first Coupled Model Inter-Comparison Project (CMIP1) became available about a decade later4.

Results of first energy model comparison exercise, conducted under the auspices of the Stanford Energy Modeling Forum, were published in 1977. A summary of the first comparison focused on climate change was published in 1993. As energy

models were coupled to simple economic and climate models to form IAMs, the first comparison exercise for IAMs (EMF 14; https://emf.stanford.edu/projects) was initiated in 1994, and IAM comparison exercises have been ongoing since this time^{7–10} — and were recently assessed in the latest IPCC report¹¹ — including a publicly accessible database of scenarios (https://secure.iiasa.ac.at/web-apps/ene/AR5DB).

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CORRESPONDENCE:

Strategies for changing the intellectual climate

To the Editor— Castree et al.¹ are correct that a 'single, seamless concept of integrated knowledge' cannot do justice to the diversity of meanings that need to be brought to bear in addressing the challenges of global environmental change. We also agree with them that environmental social sciences and humanities (ESSH) can make important contributions to global environmental change (GEC) science. However, their charge that we ignore the full range of anthropological contributions to understanding of climate change reflects a misreading of our recent Perspective' in this journal, as we only attempted to

discuss a few exemplary strands of the many contributions from anthropology to a richer understanding of climate change (for a more detailed discussion, see our forthcoming edited volume³).

Secondly, Castree et al. suggest that we are reinforcing the status quo in GEC science and 'pulling our punches' by using terms common in Earth systems science (such as system and mechanism). Our use of such terms reflected a strategy to use familiar language to raise awareness of anthropological contributions little known to most GEC scientists, along the lines of the 'clumsy solutions' proposed by

anthropologist Steven Rayner⁴. Rayner calls for these solutions to 'wicked problems' such as climate change — problems marked by deep underlying conflictsabout the nature of the problem itself — because they can allow different actors to work together without sharing ethical or epistemological principles. We agree with Castreeet al. that other strategies are possible, but not that theirs is the only route to a wider dialogue.

Castree et al. focus on three texts to illustrate how GEC scientists evoke the notion of seamless, totalizing knowledge. They single out the use of terms such as 'integration' in discussions of knowledge to

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COMMENTARY:

Pricing climate risk mitigation

Joseph E. Aldy

Adaptation and geoengineering responses to climate change should be taken into account when estimating the social cost of carbon.

t the September 2014 United Nations Climate Summit, 73 countries and more than 1,000 companies advocated pricing carbon¹. Economists have long called for pricing carbon to reflect the social damages associated with the impacts of carbon dioxide emissions on the global climate^{2,3}. Such an approach generally reflects the polluter pays principle - as elaborated in the 1992 Rio declaration on environment and development, with its emphasis on the use of economic instruments to internalize environmental costs4. Scholars have also called for the organization of international negotiations around agreement on a carbon price to provide the basis for emission commitments^{5,6}.

The meaning of carbon pricing

For some policymakers, setting a price on carbon that reflects the cost of carbon pollution can inform the 'objective' of climate policy. For example, the US government uses an estimate of the social cost of carbon (SCC) — the present value of monetized damages associated with an incremental ton of carbon dioxide emissions — to evaluate standards for fuel economy, appliance efficiency and carbon emissions⁷. As some laws require regulations to reflect a weighting of benefits and costs, the application of the SCC could determine the ambition of energy and climate policies.

For other policymakers, pricing carbon is an 'instrument' of climate policy—such as carbon dioxide cap-and-trade programmes or a carbon tax. For example, the European Union emissions trading scheme and the British Columbia carbon tax impose a price that carbon dioxide-emitters must bear. Of course, these two interpretations can be mutually reinforcing. In a benefit—cost framework, a policy that maximizes net social benefits would equate the SCC with the price borne by emitters under a tax or cap-and-trade instrument⁸.

Whether the SCC determines the objective of policy, informs the design of a pricing instrument, or serves as a focal point

in international negotiations, it will play an important role in the future of climate change policy. The social damages of carbon emissions will depend on the impacts of a warming world, such as sea-level rise, extreme weather events and changes in agricultural productivity, as well as potential catastrophic harms, migration, conflict and so on⁹. The SCC will also vary with alternative efforts to mitigate climate change risks, such as adaptation and geoengineering. Thus, it is important to conceptualize the SCC in the context of the full suite of risk management policies for climate change.

Managing risks posed by climate change

Policymakers, individuals and businesses can use three general approaches to mitigate the risks posed by climate change. First, they can halt the atmospheric accumulation of greenhouse gases, thereby preventing the problem through emission abatement. Second, they can avoid some climate change impacts by making investments in adaptation and resilience. Third, they can attempt to 'fix' the problem through geoengineering, such as solar radiation management strategies.

This nultipronged approach to mitigating climate risk has emerged only recently in the debate over climate change policy. In the 1990s, international and domestic climate change policy focused almost exclusively on emission abatement. In the early 2000s, adaptation joined emission abatement in multilateral negotiations as well as development policy. In recent years, scholars have raised the prospect of geoengineering paired with emission abatement to avoid potentially catastrophic climate change 10-12. Putting a price on carbon for emission abatement that fails to account for adaptation and geoengineering risks could leave too few resources for these options, which have potentially high returns in reducing climate change damages.

Role of adaptation and geoengineering

Pricing carbon within a comprehensive risk management framework requires continued

work and advances in our understanding of climate change damages. Scholars from an array of disciplines have raised questions about the damage functions in the integrated assessment models that generate SCC estimates 9.13.14. Improving the knowledge base on climate change impacts is a necessary foundation for evaluating the risk mitigation impacts of emission abatement, adaptation and geoengineering.

The status quo integrated assessment model approach produces an estimate of SCC without consideration of geoengineering and typically with incomplete or ad hoc attempts to represent adaptation 15. Of the more than 400,000 SCC estimates produced by the US government in its 2013 report¹⁵, 160 scenarios had a SCC in excess of US\$1,000 per ton — or nearly US\$10,000 in annual climate damages per US household — for its residential energy consumption. It is difficult to imagine that if the world were in such a dire state there would be no increase in adaptation investment or geoengineering deployment to offset at least some of these impacts.

Many individuals and businesses have strong incentives to mitigate their exposure to risks related to climate change. If the impacts of climate change become more severe, then they will increase their private adaptation investments. Moreover, governments are likely to increase outlays for resilience and adaptation if climate risks become more pronounced.

Adaptation will not fully offset the increase in damages, but it is likely to offset some climate change risk. As a result, the integrated assessment framework for evaluating the damages of an incremental emission of carbon dioxide should be expanded to include an 'adaptation response function'. Such a function (or system of functions) would represent how adaptation actions by governments and private agents respond to climate change, how adaptation affects the residual damages associated with another ton of carbon dioxide in the air, and how much this adaptation costs. This adaptation response

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ENVIRONMENTAL ECONOMICS

Using and improving the social cost of carbon

Regular, institutionalized updating and review are essential

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social cost of carbon (SCC) is a crucial tool for economic analysis of climate policies. The SCC estimates the dollar value of reduced climate change damages associated with a one-metric-ton reduction in carbon dioxide (CO_a) emissions. Although the conceptual basis, challenges, and merits of the SCC are well established, its use in government cost-benefit analysis POLICY (CBA) is relatively new. In light of challenges in constructing the SCC, its newness in government requlation, and the importance of updating, we propose an institutional process for regular SCC review and revision when used in government policy-making and suggest how scientists might contribute to improved SCC estimates.

Although regulations issued by U.S. federal agencies have been subject to CBA for four decades, those analyses largely ignored economic benefits of carbon reduction until a federal court held in 2008 that carbon emission reductions have nonzero value. After a brief period during which different U.S. agencies used different SCC numbers, an interagency working group established a single set of government-wide values in 2009 and 2010, with an update in 2013 (1).

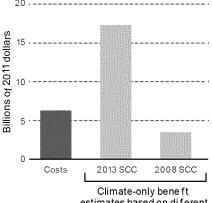
Such updates arise because the science, impact estimates, and socioeconomic models used to develop the SCC continue to evolve, as do expert opinions about how it should be synthesized. The results for CBA are consequential (see the graph). Using the most recent central value of interagency SCC estimates, a proposed U.S. rule on emissions from existing power plants would pass a CBA on climate benefits alone (2); using the central value SCC from a single agency in 2008 (3), it would not.

Estimating the SCC in a particular year, say 2015, involves four steps: (i) projecting a future path of global greenhouse gas (GHG) emissions; (ii) translating this emissions path, along with an alternative that adds 1 ton in 2015, into alternate scenarios of climate change; (iii) estimating physical impacts of these climate changes on hu-

mans and ecosystems; and (iv) monetizing these impacts and discounting future monetary damages back to 2015. The SCC is the difference in damage valuations with and without the extra ton of CO₂ in 2015.

Integrated assessment models [IAMs; e.g., DICE (4), FUND (5), and PAGE (6)], perform all four steps. Underlying step (i) are assumptions about future climate change policies and their effects on GHG emissions and about population, GDP growth, and technology. In step (ii), a simplified representation of the climate system translates emissions to metrics of climate change (e.g., change in global average temperature). Steps (iii) and (iv) require a damage function that relates climate change metrics to climate impacts and to valuations. Valuation of impacts often aggregates and/or extrapolates detailed climate impact studies and relies on population and economic assumptions from

Costs and benefts of emissions reductions



estimates based on different government SCC values

Benefits of regulations vary. Estimated costs and climate change benefits of emission reductions in 2020 from proposed U.S. power plant regulations using 2008 (3) and 2013 (2) government SCC estimates. Estimates from table 18 in (2) using a 3% discount rate averaged over state and regional approaches. SCC estimate from table V-3 in (3), rising 2.4% per year to \$8.67 in 2020, multiplied by avoided emissions estimates averaged over state and regional approaches from table 10 in (2), and inflation adjusted using the implicit GDP price index from the U.S. Bureau of Economic Analysis.

step (i) to project the level of human and economic activity exposed to these impacts in the future.

DIFFICULT CHOICES. Constructing an SCC for government CBA requires specific choices, beginning with the selection of which IAMs to include. Models vary in terms of breadth of use, degree of public access and available peer review, and incorporation of latest scientific results. New IAMs may emerge. How should a government select among models? Should selection evolve over time? Should models be weighted? If so, how?

Next, one must choose what, if any, assumptions to harmonize across models. Such assumptions may be important for consistency between the SCC and other elements of a government CBA, to reflect important uncertainties, or to address possibly outdated assumptions.

This harmonization requires more tough choices. For example, the SCC will measure incremental policy benefits relative to a baseline or range of baselines, which must be explicitly selected. One must decide whether emissions are forecast on the basis of an ambitious climate policy (such as the scenario in which polluters are already forced to pay the estimated SCC), a scenario where only policies already on the books remain in place, or something in between.

There are also credible differences on analytic and ethical grounds regarding the appropriate discount rate. Previous government guidance for CBA suggested discount rates of 3 and 7% for most projects, with possibly lower rates for phenomena (like climate change) with important intergenerational effects (7). Such differences have enormous implications; federal SCC estimates tripled as the discount rate changes from 5 to 3% (1). For practical CBA, it is important to have distinct SCC estimates for different discount rates that can be paired with cost estimates based on a particular discount rate(s).

Each IAM will have its own internal discount rate determined by model parameters and socioeconomic forecasts. Low discount rates typically follow from low economic growth (8), and economic growth is tied to climate impacts. Given this connection, how problematic is it to impose a discount rate in the SCC that is different from the rate used within the IAM itself?

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From My Perspective

Critical review of: "Making or breaking climate targets—the AMPERE study on staged accession scenarios for climate policy" (TFSC 17862)

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article info

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abstract

This critical review of the integrated assessment modeling (IAM) research underlying the AMPERE study is also relevant to many other IAM-based model comparison papers. One of the main symptoms of the serious methodological problems of these studies is that the results produced by different models for what are portrayed as the "same" scenarios differ quite substantially from each other. While the authors of the AMPERE study correctly raise the important question of whether these differences are due primarily to differences in model structures, or to differences in the sets of input assumptions for the "same" scenario used by different research teams, they never address this question in a logically systematic and credible way. In fact, they cannot and do not arrive at an answer, since each modeling team generally relies on a single but different set of most input assumptions for the same scenario. Finally, the research teams involved in the AMPERE project, and other similar projects, fail to understand the fundamental impossibility of forecasting net mitigation costs or benefits over the long run given both the practical and deep uncertainties implicit in both the equations comprising these IAMs, and the input assumptions on which they rely.

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1. Introduction

The AMPERE project was a major EU-funded research effort to try to determine the economics and, therefore, the desirability of "staged accession" scenarios to mitigate climate change at the global level through 2100, with a focus on the European Union as the key actor. The results of this research are presented in the TFSC article under review here (Kriegler et al., 2014). Staged accession scenarios appear to involve various regions of the world taking action to mitigate climate change in different ways and at different times, rather than collectively at the same time. This project produced several mitigation scenarios for analysis and comparison to a reference policy case. The details of these mitigation scenarios are not important for our critical analysis here. Instead, what is important is the project's focus on the differences in the long-run economic results for different mitigation scenarios when compared to the reference policy case, especially the results for the EU and China. These economic results include the present value of the GDP and other economic

costs and benefits computed by the models, as well as the cost of carbon prices computed in different scenarios.

The purpose of this critical review, which is unusual within the literature on the economics of mitigating climate change, is to try to enumerate the major weaknesses of the AMPERE project in attempting to apply credible methodologies for analyzing the results of this type of modeling study. One goal of this critique is to encourage the various integrated assessment modeling teams around the world to reconsider their research priorities in light of the types of problems identified here. If integrated assessment models of the types utilized in this major EU project are going to be used in the future to assist policy makers, the ways they are used, as well as the models themselves, will require major modifications. And while the issue of TFSC in which this overview of the AMPERE study was published also contains many other articles on related topics, I

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¹ This paper will not address the model flaws, some of which are addressed in reference 2, and other papers referenced in that paper.



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The economics of mitigating climate change: What can we know?



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abstract

The long-term economics of mitigating climate change over the long run has played a high profile role in the most important analyses of climate change in the last decade, namely the Stern Report and the IPCC's Fourth Assessment. However, the various kinds of uncertainties that affect these economic results raise serious questions about whether or not the net costs and benefits of mitigating climate change over periods as long as 50 to 100 years can be known to such a level of accuracy that they should be reported to policymakers and the public. This paper provides a detailed analysis of the derivation of these estimates of the long-term economic costs and benefits of mitigation. It particularly focuses on the role of technological change, especially for energy efficiency technologies, in making the net economic results of mitigating climate change unknowable over the long run.

Because of these serious technical problems, policymakers should not base climate change mitigation policy on the estimated net economic impacts computed by integrated assessment models. Rather, mitigation policies must be forcefully implemented anyway given the actual physical climate change crisis, in spite of the many uncertainties involved in trying to predict the net economics of doing so.

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1. Introduction

Over the past 10 years, dozens of articles, reports, and papers have addressed the economics of mitigating climate change. As one might expect, both the quantitative results and the computational models that produced them have changed somewhat, though not dramatically, over time. During that decade, the negative impacts of climate change on the physical world have become more frequent, and most proposed climate mitigation targets have become more stringent. Today, the generally accepted temperature target, to which most governments agree, would limit the increase in temperature due to greenhouse gas emissions derived from human-related activities to 2 °C, relative to pre-industrial times, by 2100. As years pass, the time remaining to meet

that target decreases. Furthermore, the costs of mitigating climate change will tend to increase if mitigation is delayed and if future energy technology costs and performance characteristics follow current forecasts, although forecasts of some of these important parameters have changed significantly over the last 10 years. Of course, the actual prices of the fossil fuels that climate change mitigation would displace have also changed in this time, even more than the long-run forecasts of future fuel prices, raising interesting questions about the current forecasts.

The best and most recent comprehensive reviews of the economics of mitigating climate change appeared in the Working Group III report of the Fourth Climate Assessment of the Intergovernmental Panel on Climate Change (IPCC) and the 6, sponsored by the British government [1,2]. Since both reports were published in 2007, the underlying research would have been undertaken prior to or during 2006, making both studies somewhat out-of-date already. However,

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John Weyant*

Integrated assessment of climate change: state of the literature

Abstract: This paper reviews applications of benefit-cost analysis (BCA) in climate policy assessment at the US national and global scales. Two different but related major application types are addressed. First there are global-scale analyses that focus on calculating optimal global carbon emissions trajectories and carbon prices that maximize global welfare. The second application is the use of the same tools to compute the social cost of carbon (SCC) for use in US regulatory processes. The SCC is defined as the climate damages attributable to an increase of one metric ton of carbon dioxide emissions above a baseline emissions trajectory that assumes no new climate policies. The paper describes the three main quantitative models that have been used in the optimal carbon policy and SCC calculations and then summarizes the range of results that have been produced using them. The results span an extremely broad range (up to an order of magnitude) across modeling platforms as well as across the plausible ranges of input assumptions to a single model. This broad range of results sets the stage for a discussion of the five key challenges that face BCA practitioners participating in the national and global climate change policy analysis arenas: (1) including the possibility of catastrophic outcomes; (2) factoring in equity and income distribution considerations; (3) addressing intertemporal discounting and intergenerational equity; (4) projecting baseline demographics, technological change, and policies inside and outside the energy sector; and (5) characterizing the full set of uncertainties to be dealt with and designing a decision-making process that updates and adapts new scientific and economic information into that process in a timely and productive manner. The paper closes by describing how the BCA models have been useful in climate policy discussions to date despite the uncertainties that pervade the results that have been produced.

Keywords: benefit-cost analysis; climate change; integrated assessment; optimal carbon emissions; social cost of carbon.

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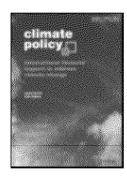
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Incorporating 'catastrophic' climate change into policy analysis

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What Do We Learn from the Weather? The New Climate—Economy Literature

Melissa Dell, Benjamin F. Jones, and Benjamin A. Olken*

A rapidly growing body of research applies panel methods to examine how temperature, precipitation, and windstorms influence economic outcomes. These studies focus on changes in weather realizations over time within a given spatial area and demonstrate impacts on agricultural output, industrial output, labor productivity, energy demand, health, conflict, and economic growth, among other outcomes. By harnessing exogenous variation over time within a given spatial unit, these studies help credibly identify (i) the breadth of channels linking weather and the economy, (ii) heterogeneous treatment effects across different types of locations, and (iii) nonlinear effects of weather variables. This paper reviews the new literature with two purposes. First, we summarize recent work, providing a guide to its methodologies, datasets, and findings. Second, we consider applications of the new literature, including insights for the "damage function" within models that seek to assess the potential economic effects of future climate change. (JEL C51, D72, O13, Q51, Q54)

1. Introduction

"slothful and dispirited." To the extent that climatic factors affect economically rel

The idea that climate may substantial legyant outcomes, whether agricultural out influenceeconomic performance is apout, economic growth, health, or conflicta old one, featuring prominently in the writareful understanding of such effects may ings of the Ancient Greeks, in Ibn Khaldunbae essential to the effective design of con fourteenth-century Muqaddimah (Gates temporary economic policies and institu 1967), and during the Enlightenment, when tions. Moreover, with global temperatures Montesquieu argued in the Spirit of Laws expected to rise substantially over the next (1748) that an "excess of heat" made mencentury, understanding these relationships is increasingly important for assessing the

"damage function" that is central to estimat *Dell: Harvard University. Jones: Northwestern Uning the potential economic implications of

versity. Olken: Massachusetts Institute of Technology. Weuture climate change. thank Marshall Burke, Janet Currie, Michael Greenstone. Solomon Hsiang, Elizabeth Moyer, Robert Pindyck, Rich A basic challenge in deciphering the rela ard Schmalensee, Susan Solomon, and five nonymous retionship between climatic variables and eco erees for helpful comments. nomic activity is that the spatial variation [†] Go tohttp://dx.doi.org/10.1257/je1.52.3.7**40** visit the in climate is largely fixedCanada is colder

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A RAPID ASSESSMENT MODEL FOR UNDERSTANDING THE SOCIAL COST OF CARBON*

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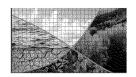
The "social cost of carbon" (SCC) is the present value of the stream of future damages from one additional unit of carbon emissions in a particular year. This paper develops a rapid assessment model for the SCC. The model includes the essential ingredients for calculating the SCC at the global scale and is designed to be transparent and easy to use and modify. Our goal is to provide a tool to help analysts and decision-makers quickly explore the implications of various modeling assumptions for the SCC. We use the model to conduct sensitivity analyses over some of the key input parameters, and we compare estimates of the SCC under certainty and uncertainty in a Monte Carlo analysis. We find that, due to the combined effects of uncertainty and risk aversion, the certainty-equivalent SCC can be substantially larger than the expected value of the SCC. In our Monte Carlo simulation, the certainty-equivalent SCC is more than four times larger than the expected value of the SCC, and we show that this result depends crucially on how the uncertain preference parameters are handled. We also compare the approximate present value of benefits estimated using the SCC to the exact value of compensating variation in the initial period for a wide range of hypothetical emission reduction policies.

Keywords: Climate change; integrated assessment model; social cost of carbon; climate sensitivity.

1. Introduction

The "social cost of carbon" (SCC) is a commonly estimated measure of the economic benefits of reductions in emissions of carbon dioxide (CO₂), the predominant anthropogenic greenhouse gas (e.g., Tol, 2005, 2008; Nordhaus, 2008; Hope, 2006, 2008; Anthoff *et al.*, 2009a,b). The SCC represents the present value of the stream of future damages from an incremental increase in CO₂ emissions in a particular year, and therefore it also represents the marginal benefit of emissions reductions. The SCC is intended to be a comprehensive measure of damages, including the impacts of global warming on agricultural productivity and human health; loss of property and

^{*}The views expressed in this paper are those of the authors and do not necessarily represent those of the U.S. EPA. No Agency endorsement should be inferred.



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DEVELOPING INNOVATIVE ANSWERS TO TODAY'S COMPLEX ENVIRONMENTAL CHALLENGES

March 2015 Discussion Paper 15-62

The Role of Integrated Assessment Models in Climate Policy: A User's Guide and Assessment

Gilbert Metcalf
Tufts University

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The United States and others should consider adopting a different approach to estimating

costs and benefits in light of uncertainty.

ENVIRONMENTAL ECONOMICS

Determining Benefits and Costs for Future Generations

K. Arrow, ¹ M. Cropper, ^{2,3*} C. Gollier, ⁴ B. Groom, ⁵ G. Heal, ⁶ R. Newell, ^{3,7,8} W. Nordhaus, ⁹ R. Pindyck, ¹⁰ W. Pizer, ^{3,11} P. Portney, ^{3,12} T. Sterner, ^{3,13} R. S. J. Tol, ^{14,15} M. Weitzman¹⁶

In economic project analysis, the rate at which future benefits and costs are discounted relative to current values often determines whether a project passes the benefit-cost test. This is especially true of projects with long time horizons, such as those to reduce greenhouse gas (GHG) emissions. Whether the benefits of climate policies, which can last for centuries, outweigh the costs, many of which are borne today, is especially sensitive to the rate at which future benefits are discounted. This is also true of other policies, e.g., affecting nuclear waste disposal or the construction of long-lived infrastructure.

A declining discount rate (DDR) schedule, as used by the governments of France and the United Kingdom (1, 2), means that all benefits and costs occurring in a given year are discounted at the same rate, but this rate declines over time. In contrast, the United States and other countries use discount rates that are constant over time; a lower constant discount rate is sometimes used to evaluate projects that affect future generations. We summarize the arguments in favor of using a DDR schedule and discuss the problems in using different constant discount rates to evaluate inter- and intragenerational benefits. The use of a DDR schedule would avoid these problems.

What Does the Discount Rate Represent?

There are two rationales for discounting future benefits, one consumption- and the other investment-based. The consumption rate of discount reflects the rate at which society is willing to trade consumption in the future for consumption today. Basically, we place a lower value on the consumption of future generations, because we assume that future generations will be wealthier than

we are and that the utility people receive from an extra dollar of consumption declines as their level of consumption increases. To illustrate, if per capita consumption grows at 1.3% per year, in 200 years it will be more than 13 times today svalue. So a dollar of consumption received 200 years from now will therefore be worth less than it is today (3).

The investmentapproach says that, as long as the rate of return to investment is

positive, we need to invest less than a dollar today to obtain a dollar of benefits in the future. Under the investment approach, the discount rate is the rate of return on investment. If there were no distortions (e.g., taxes) or inefficiencies in markets, the consumption rate of discount would equal the rate of return on investment. There are, however, many reasons why the two may differ (4), which is why the U.S. Office of Management and Budget (OMB) requires projects involving intragenerational benefits and costs to be evaluated twice, once by using a constant discount rate of 3% to approximate the consumption rate of discount and, separately, by using a discount rate of 7% the real, pretax average return on private investment. For regulations with important intergenerational benefits or costs, OMB advises analysts to consider an additional lower but positive discount rate (5).

Using a constant discount rate for intergenerational benefits and costs that is lower than the rate used to evaluate intragenerational benefits and costs can lead to incon-

Present value of a cash flow of \$1000 received after t years Value (\$) of \$1000 at a discount rate of Certainty equivalent Equally likely 1% 4% 1% or 7% expected value 990.05 960.79 932.39 3.94 961.22 10 904.84 670.32 496.59 700.71 3.13 50 606.53 135.34 30.20 318.36 1.28 100 367.88 18.32 0.91 184.40 1.02 150 223.13 2.48 0.03 111.58 1.01 200 135 34 0.34 റ ററ 67 67 1.01 300 49.79 0.01 0.00 24.89 1.01 18.32 റ ററ 0.00 9.16 1.01

Present value of a cash flow of \$1000 received after t years. Expected value is the average of values from the 1% and 7% columns.

sistencies in decision-making. In a recent regulatory impact analysis of Corporate Average Fuel Economy standards for motor vehicles (6), benefits associated with reduced GHG emissions were discounted at a lower rate than fuel savings associated with the proposed standards. This resulted in benefits occurring in the same year being discounted at different rates. This is clearly inappropriate (7). Consistency in decisionmaking requires that the same discount rate must be applied to all certain benefits and costs that occur in the same year, irrespective of whether the project has intra- or intergenerational consequences. With a DDR schedule, benefits and costs in a given year are discounted at the same rate, but the rate declines over time.

Why Might the Discount Rate Decline?

Uncertainty about future discount rates leads to a DDR schedule (8). This can be illustrated by a simple example. Suppose we wish to discount \$1000 received t years from now to the present. The net present value (NPV) of $1000 = 1000 \exp(rt)$, where t is the discount rate. If the discount rate is $1000 \exp(rt)$, the NPV of $1000 \exp(rt)$ received in $100 \exp(rt)$ years is 18.32 (see the table).

But future discount rates are inherently uncertain. Suppose that we think the interest rate is equally likely to be 1% or 7% in 100 years. We evaluate the NPV using its expected value (9), averaging the

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Should Governments Use a Declining Discount Rate in Project Analysis?

Kenneth J. Arrow*, Maureen L. Cropper^y, Christian Gollier^z, Ben Groom[§], Geoffrey M. Heal^{ffi}, Richard G. Newell^k, William D. Nordhaus[#], Robert S. Pindyck**, William A. Pizer^{yy}, Paul R. Portney^{zz}, Thomas Sterner^{§§}, Richard S. J. Tof^{fiffi}, and Martin L. Weitzman^{kk}

Introduction

In project analysis, the rate at which future benefits and costs are discounted often determines whether a project passes the benefit-cost test. This is especially true of projects that have long timehorizons, such as those aimed at reducing greenhouse gas (GHG) emissions. In the case of

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At a workshop held at Resources for the Future in September 2011, twelve of the authors were æsked by the US Environmental Protection Agency (EPA) to provide advice on the principles to be used in discounting the benefits and costsof projects that affect future generations. Maureen L.Cropperchaired theworkshop. Muchof the discussion in this article is based on the authors' recommendations and advice presented at the workshop.

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SOCIAL COST OF CARBON

THE GLOBAL COST OF CLIMATE CHANGE AND LOCAL IMPACTS ON COMMUNITIES







LETTERS 140 A DESCRIPTION OF THE PARTY OF TH

Temperature impacts on economic growth warrant stringent mitigation policy

Frances C. Moore^{1,2*} and Delavane B. Diaz³

Integrated assessment models compare the costs of greenhouse gas mitigation with damages from climate change to evaluate the social welfare implications of climate policy proposals and inform optimal emissions reduction trajectories. However, these models have been criticized for lacking a strong empirical basis for their damage functions, which do little to alter assumptions of sustained gross domestic product (GDP) growth, even under extreme temperature scenarios¹⁻³. We implement empirical estimates of temperature e←ects on GDP growth rates in the DICE model through two pathways. total factor productivity growth and capital depreciation^{4,5}. This damage specification, even under optimistic adaptation assumptions, substantially slows GDP growth in poor regions but has more modest e← ects in rich countries. Optimal climate policy in this model stabilizes global temperature change below 2 °C by eliminating emissions in the near future and implies a social cost of carbon several times larger than previous estimates⁶. A sensitivity analysis shows that the magnitude of climate change impacts on economic growth, the rate of adaptation, and the dynamic interaction between damages and GDP are three critical uncertainties requiring further research. In particular, optimal mitigation rates are much lower if countries become less sensitive to climate change impacts as they develop, making this a major source of uncertainty and an important subject for future research.

Integrated assessment models (IAMs) have traditionally captured the negative impacts of climate change with a damage function that relates global temperature change to a loss of current economic output. This formulation captures the transient e-ects of climate on the economy such as lost agricultural output, increased cooling demand, or lower worker productivity due to hotter temperatures⁷⁻⁹ Factors of production, namely labour and capital, and their total factor productivity (TFP) are not directly impacted, meaning that climate change has no e-ect, or only a very weak e-ect, on GDP growth. Two IAMs recently used for the US government social cost of carbon (SCC) estimate, FUND and PAGE, assume that GDP growth is entirely exogenous 10,11. In the DICE model, labour and TFP are specified exogenously and capital formation is determined through endogenous investment decisions⁵; temperature shocks can therefore alter economic growth through capital stock reductions, but this e-ect is small and indirect12.

Damages from climate change that directly a-ect growth rates have the potential to markedly increase the SCC because each temperature shock has a persistent e-ect that permanently lowers GDP below what it would otherwise be (Supplementary Fig. 1). Continued warming therefore has a compounding e-ect over time, so that even very small growth e-ects result in much larger

Table 1 | Parameters used to calibrate the gro-DICE damage functions, reported in Dell et al. Table 3, column 4 (ref. 4).

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	1 ^B C temp increase		temp increase
on GDF	P growth rates (on econon	nic output (□ ₀)
Poor 1.171 pp)	0.426%	
Rich 0.152 p)p	0.371%	

This specification includes 10 temperature lags and no precipitation controls. A brief summary of the estimation strategy used in ref. 4 is given in the Supplementary Information. pp. percentage point.

impacts than the traditional damage formulation¹². Examples of pathways by which temperature could a-ect the growth rate of GDP include damage to capital stocks from extreme events, reductions in TFP because of a change in the environment that investments were originally designed for, or slower growth in TFP because of the diversion of resources away from research and development and towards climate threats1. Empirical evidence that these impacts exist is mounting. Two studies have found a reduced-form relationship between temperature shocks and GDP growth^{4,13}, and other studies have demonstrated plausible pathways including increasing conflict risk¹⁴ and changes in labour supply¹⁵. Previous work has demonstrated that DICE results are sensitive to the inclusion of growth impacts^{12,16}, but no previous studies have calibrated these damages using empirically grounded results from the econometrics literature. Given the potentially first-order impacts of these growth e-ects, understanding their implications for climate policy is of critical importance.

Here we examine alternative formulations of the DICE damage function based on empirical estimates of the impact of interannual temperature variability on national economic output and growth rates by Dell and colleagues⁴. They find large, statistically significant negative e-ects of hot temperatures on growth rates in poor countries, smaller e-ects in rich countries, and mixed e-ects on output (Table 1). To implement these parameters in an IAM, we develop a two-region version of DICE (ref. 17; DICE-2R). We then modify the damage pathway so that warming a-ects either TFP growth or capital depreciation as per results in ref. 4 (gro-DICE) and investigate sensitivities to the parameters used by Dell et al.⁴ (Methods). We present results of the TFP pathway here, but the capital pathway gives quantitatively similar results and is discussed further in the Methods and Supplementary Information.

As Dell et al.4 use transient and largely unanticipated weather shocks in their estimation, the growth-rate sensitivities (reduction

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Robert S. Pindyck

Working Paper 21097 http://www.nber.org/papers/w21097

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A RAPID ASSESSMENT MODEL FOR UNDERSTANDING THE SOCIAL COST OF CARBON[®]

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The "social cost of carbon" (SCC) is the present value of the stream of future damages from one additional unit of carbon emissions in a particular year. This paper develops a rapid assessment model for the SCC. The model includes the essential ingredients for calculating the SCC at the global scale and is designed to be transparent and easy to use and modify. Our goal is to provide a tool to help analysts and decision-makers quickly explore the implications of various modeling assumptions for the SCC. We use the model to conduct sensitivity analyses over some of the key input parameters, and we compare estimates of the SCC under certainty and uncertainty in a Monte Carlo analysis. We find that, due to the combined effects of uncertainty and risk aversion, the certainty-equivalent SCC can be substantially larger than the expected value of the SCC. In our Monte Carlo simulation, the certainty-equivalent SCC is more than four times larger than the expected value of the SCC, and we show that this result depends crucially on how the uncertain preference parameters are handled. We also compare the approximate present value of benefits estimated using the SCC to the exact value of compensating variation in the initial period for a wide range of hypothetical emission reduction policies.

Keywords: Climate change; integrated assessment model; social cost of carbon; climate sensitivity.

1. Introduction

The "social cost of carbon" (SCC) is a commonly estimated measure of the economic benefits of reductions in emissions of carbon dioxide (CO₂), the predominant anthropogenic greenhouse gas (e.g., Tol, 2005, 2008; Nordhaus, 2008; Hope, 2006, 2008; Anthoff et al., 2009a,b). The SCC represents the present value of the stream of future damages from an incremental increase in CO₂ emissions in a particular year, and therefore it also represents the marginal benefit of emissions reductions. The SCC is intended to be a comprehensive measure of damages, including the impacts of global warming on agricultural productivity and human health; loss of property and

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CALCULATING THE SOCIAL COSTS OF CARBON WITHOUT KNOWING PREFERENCES COMMENT ON "A RAPID ASSESSMENT MODEL FOR UNDERSTANDING THE SOCIAL COST OF CARBON"

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The Social Costs of Carbon (SCC) equals the marginal welfare loss associated with one unit of emitted CO_2 , divided by the marginal welfare gain associated with one unit of consumption. In stochastic assessments, both the nominator and denominator can depend on uncertain parameters; specifically they depend on the (implicit) scaling of the welfare function with the parameters. I discuss some pitfalls when calculating the expected value or the certainty equivalent of the SCC, and show that a mistaken procedure easily leads to very high or very low estimates for the SCC. I use the paper by Newbold et al. (2013) as an illustration.

Keywords: Climate change; social cost of carbon; integrated assessment models; uncertainty.

1. Introduction

It is common to calculate the expected value for the social costs of carbon (SCC), but the precise meaning is not so clear. Here, I will discuss the assumptions needed to calculate an expected SCC measure, and I will show that violation of these assumptions results in misleading estimates for the SCC. The SCC plays an increasingly important role in climate policy recommendations, and it is essential that we understand its fundamentals and identify potential mistakes. As a case in point, I will show that the measure developed by Newbold et al. (2013) for the "Certainty-Equivalent" SCC, which returns a very high level for the SCC compared to previous estimates, is based on a mistaken procedure and does not provide a proper estimate for the SCC.

Metrics matter when taking expectation. Assume, we have equal probability that climate sensitivity is 1 K (Kelvin) or 5 K, so that the expected climate sensitivity is 3 K.

¹See van den Bijgaart et al. (2013) for a simple framework and a quick assessment of the major uncertainties and their role in the distribution function and expected value of the SCC.

What Do We Learn from the Weather? The New Climate—Economy Literature

Melissa Dell, Benjamin F. Jones, and Benjamin A. Olken*

A rapidly growing body of research applies panel methods to examine how temperature, precipitation, and windstorms influence economic outcomes. These studies focus on changes in weather realizations over time within a given spatial area and demonstrate impacts on agricultural output, industrial output, labor productivity, energy demand, health, conflict, and economic growth, among other outcomes. By harnessing exogenous variation over time within a given spatial unit, these studies help credibly identify (i) the breadth of channels linking weather and the economy, (ii) heterogeneous treatment effects across different types of locations, and (iii) nonlinear effects of weather variables. This paper reviews the new literature with two purposes. First, we summarize recent work, providing a guide to its methodologies, datasets, and findings. Second, we consider applications of the new literature, including insights for the "damage function" within models that seek to assess the potential economic effects of future climate change. (JEL C51, D72, O13, Q51, Q54)

1. Introduction

"slothful and dispirited." To the extent that climatic factors affect economically rel

The idea that climate may substantial legyant outcomes, whether agricultural out influenceeconomic performance is apout, economic growth, health, or conflict, old one, featuring prominently in the writareful understanding of such effects may ings of the Ancient Greeks, in Ibn Khaldunbee essential to the effective design of confourteenth-century Muqaddimah (Gates temporary economic policies and institu 1967), and during the Enlightenment, when tions. Moreover, with global temperatures Montesquieu argued in the Spirit of Laws expected to rise substantially over the next (1748) that an "excess of heat" made mencentury, understanding these relationships is increasingly important for assessing the

is increasingly important for assessing the "damage function" that is central to estimat

*Dell: Harvard University. Jones: Northwestern Uning the potential economic implications of versity. Olken: Massachusetts Institute of Technology. We ture climate change. thank Marshall Burke, Janet Currie, Michael Greenstohe Solomon Hsiang, Elizabeth Moyer, Robert Pindyck, Rich A basic challenge in deciphering the rela ard Schmalensee, Susan Solomon, and five nonymous retionship between climatic variables and eco erees for helpful comments.

[†] Go tohttp://dx.doi.org/10.1257/je1.52.3.746 visit the article page and view author disclosure statement(s).

nomic activity is that the spatial variation in climate is largely fixed Canada is colder

Is There an Energy Efficiency Gap?

Hunt Allcott and Michael Greenstone

any analysts of the energy industry have long believed that energy efficiency offers an enormous "win-win" opportunity: through aggressive energy conservation policies, we can both save money and reduce negative externalities associated with energy use. In 1979, Pulitzer Prize-winning author Daniel Yergin and the Harvard Business School Energy Project made an early version of this argument in the book *Energy Future*:

If the United States were to make a serious commitment to conservation, it might well consume 30 to 40 percent less energy than it now does, and still enjoy the same or an even higher standard of living . . . Although some of the barriers are economic, they are in most cases institutional, political, and social. Overcoming them requires a government policy that champions conservation, that gives it a chance equal in the marketplace to that enjoyed by conventional sources of energy.

Thirty years later, consultancy McKinsey & Co. made a similar argument in its 2009 report, *Unlocking Energy Efficiency in the U.S. Economy*:

Energy efficiency offers a vast, low-cost energy resource for the U.S. economy—but only if the nation can craft a comprehensive and innovative approach to

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DoEnergyEfficiencyInvestmentsDeliver? Evidencefrom the WeatherizationAssistanceProgram

Meredith Fowlie, Michael Greenstone, and Catherine Wolfram*

June 2015

Abstract

Conventionalwisdomsuggeststhatenergyefficiency (EE) policies are beneficial because they induce investments that pay for themselves and lead to emissions reductions. However, this belief is primarily based on projections from engineering models. This paper reports on the results of an experimental evaluation of the nation's largest residential EE program conducted on a sample of more than 30,000 households. The finding suggest that the upfront investment costs are about twice the actual energy savings. Further, the model-projected savings are roughly 2.5 times the actual savings. While this might be attributed to the "rebound" effect—when demand for energy enduses increases as a result of greater efficiency—the paper fails to finde vidence of significantly higher indoor temperatures at weather ized homes. Even when accounting for the broaders ocietal benefits of energy efficiency investments, the costs still substantially out weigh the benefits; the average rate of return is approximately -9.5% annually.

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Grantham Research Institute on Climate Change and the Environment

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Discounting disentangled: an expert survey on the determinants of the long-term social discount rate

Moritz Drupp, Mark Freeman, Ben Groom and Frikk Nesje May 2015

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Harvard Environmental Economics Program

DEVELOPING INNOVATIVE ANSWERS TO TODAY'S COMPLEX ENVIRONMENTAL CHALLENGES

March 2015 Discussion Paper 15-62

The Role of Integrated Assessment Models in Climate Policy: A User's Guide and Assessment

Gilbert Metcalf
Tufts University

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Integrated assessment of climate change: state of the literature

Abstract: This paper reviews applications of benefit-cost analysis (BCA) in climate policy assessment at the US national and global scales. Two different but related major application types are addressed. First there are global-scale analyses that focus on calculating optimal global carbon emissions trajectories and carbon prices that maximize global welfare. The second application is the use of the same tools to compute the social cost of carbon (SCC) for use in US regulatory processes. The SCC is defined as the climate damages attributable to an increase of one metric ton of carbon dioxide emissions above a baseline emissions trajectory that assumes no new climate policies. The paper describes the three main quantitative models that have been used in the optimal carbon policy and SCC calculations and then summarizes the range of results that have been produced using them. The results span an extremely broad range (up to an order of magnitude) across modeling platforms as well as across the plausible ranges of input assumptions to a single model. This broad range of results sets the stage for a discussion of the five key challenges that face BCA practitioners participating in the national and global climate change policy analysis arenas: (1) including the possibility of catastrophic outcomes; (2) factoring in equity and income distribution considerations; (3) addressing intertemporal discounting and intergenerational equity; (4) projecting baseline demographics, technological change, and policies inside and outside the energy sector; and (5) characterizing the full set of uncertainties to be dealt with and designing a decision-making process that updates and adapts new scientific and economic information into that process in a timely and productive manner. The paper closes by describing how the BCA models have been useful in climate policy discussions to date despite the uncertainties that pervade the results that have been produced.

Keywords: benefit-cost analysis; climate change; integrated assessment; optimal carbon emissions; social cost of carbon.

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